

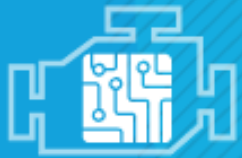
# Estimate the energy impact of new mobility technologies on personal travel modes in the San Francisco Bay Area

Tom Wenzel (PI), Colin Sheppard (Presenter), LBNL  
2017 VTO Annual Merit Review  
June 19, 2018



ENERGY EFFICIENT MOBILITY SYSTEMS PROGRAM  
INVESTIGATES

# MOBILITY ENERGY PRODUCTIVITY



Advanced R&D  
Projects



Living Labs

THROUGH FIVE EEMS  
ACTIVITY AREAS



Smart Mobility  
Lab Consortium



HPC4Mobility &  
Big Transportation Data Analytics



Core Evaluation &  
Simulation Tools

**Advanced  
Fueling  
Infrastructure**



**Connected &  
Automated  
Vehicles**



**Urban Science**



**SMART MOBILITY LAB**

# **CONSORTIUM**

7 labs, 30+ projects, 65 researchers,  
\$34M\* over 3 years.

**Mobility Decision  
Science**



**Multi-Modal  
Transport**

\*Based on anticipated funding

# Overview

## Timeline

- Start date: 10/2016
- End date: 09/2019
- Percent complete: 50%

## Budget

- Total funding: \$625k  
– DOE share: 100%
- FY 2017: \$175k
- FY 2018: \$200k

## Partners

- Project Lead: LBNL
- Partners: LBNL, UC Berkeley, Conveyal, Stanford

## Barriers

- Modal distribution has a large impact on energy consumption
- Mode shifting is sensitive to the cost and performance of the system and traveler-specific context, requiring full modal representation to accurately assess
- Detailed ride hailing data are limited in most U.S. cities
- It is difficult to observe from transit ridership data the extent to which TNCs are acting as direct substitutes versus facilitating access to transit.

# Objectives, Relevance, and Milestones

- Understand the energy implications of shifts in personal travel among conventional transit and other emerging transportation modes:
  - the degree to which TNCs change public transit use
  - the impacts of transit system improvements or degradations
- It is difficult to observe from transit ridership data the extent to which TNCs are acting as direct substitutes versus facilitating access to transit. Through simulation, this task will directly assess the ridership and energy impacts of a system with and without various TNC/transit configurations, a goal of EEMs.

## Milestones

Date	Milestone	Status
September 2017	Enhance model to simulate the effect of sectoral changes on modal composition and energy use	Complete
September 2018	Estimate effect of short-term influences, such as pricing schemes, transit expansion/electrification, and TNC/transit coupling, on energy use	On track



# Approach: Systems Modeling

- Enhance BEAM to allow the estimation of VMT and system energy use from short-term scenarios including
  - using TNC for first/last mile service to link with public transit
  - with and without surge priced TNCs
  - changes to cost and supply of TNCs and public transit
- Develop scenarios to simulate transit improvements
  - increased light rail capacity
  - bus rapid transit



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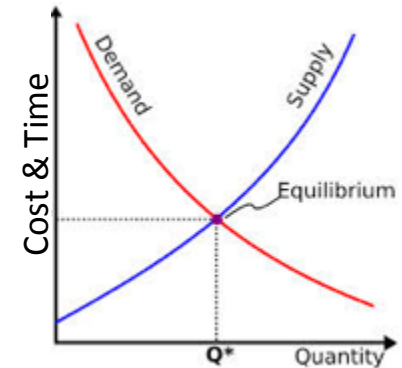
# Technical Accomplishments Summary

- Refined several modal representations in BEAM:
  - Walk
  - Bike
  - Driving
  - Walk to Transit / Drive to transit
  - Ride hailing
- Assembled San Francisco Bay Area database of transit feeds and transit energy characteristics
- Ran various sensitivity studies



# BEAM simulates Resource Markets

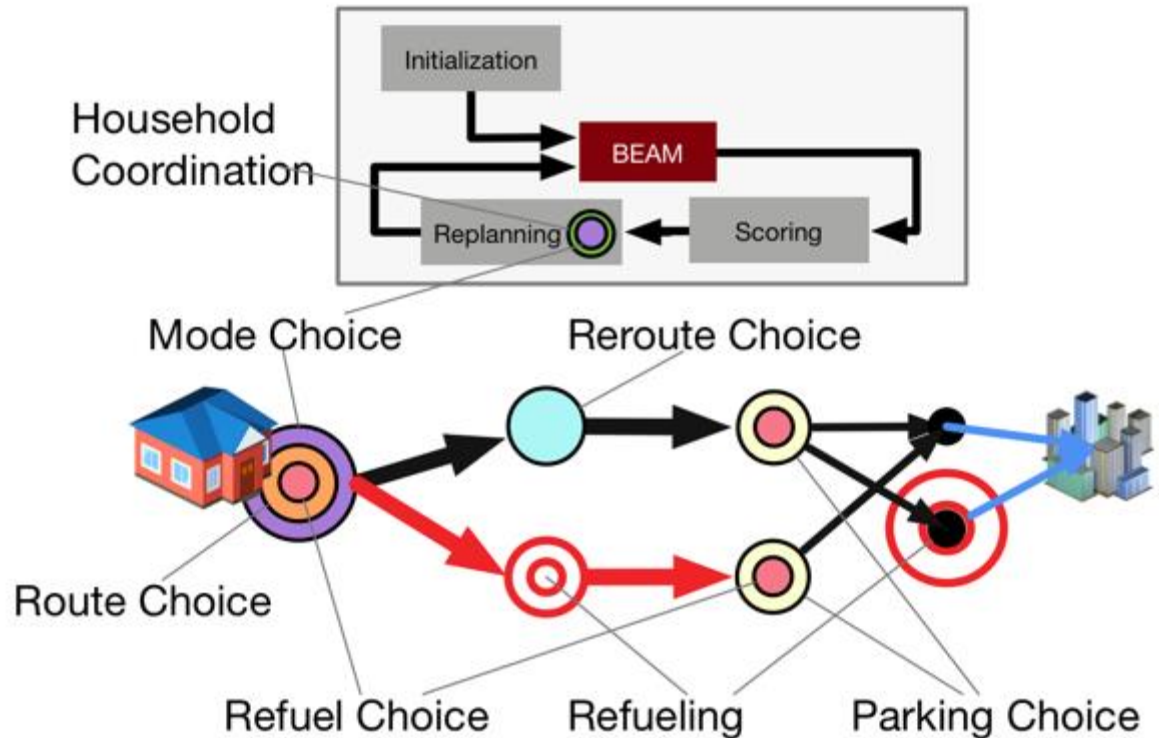
- Since AMR '17, we added new resource markets to BEAM:
  - Road Capacity
  - Vehicle Capacity
  - Parking/Refueling Access
  - TNC Availability (enhanced previous solution)
- These markets are composed of:
  - Supply:
    - Driving
    - Transit
    - Intermodal (drive to transit)
    - Walk / Bike
    - TNC (centrally managed)
    - Parking
  - Demand (governed by behaviors):
    - Mode Choice
    - Price & Time Sensitive
    - Route Choice
    - Multimodal
    - Rerouting
    - Parking Choice





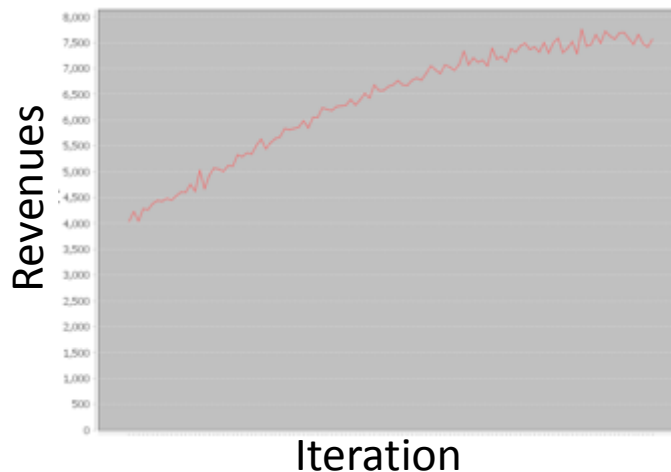
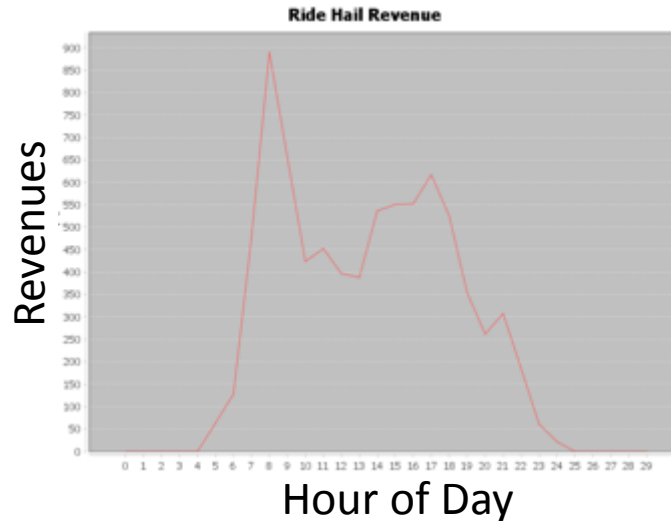
# Behavioral Modeling in BEAM

- Person agents make decisions during replanning (i.e. before the day begins) as well as throughout their day including:
  - At the point of departure: mode choice, route choice
  - During trips: rerouting, parking, and refueling (under development)

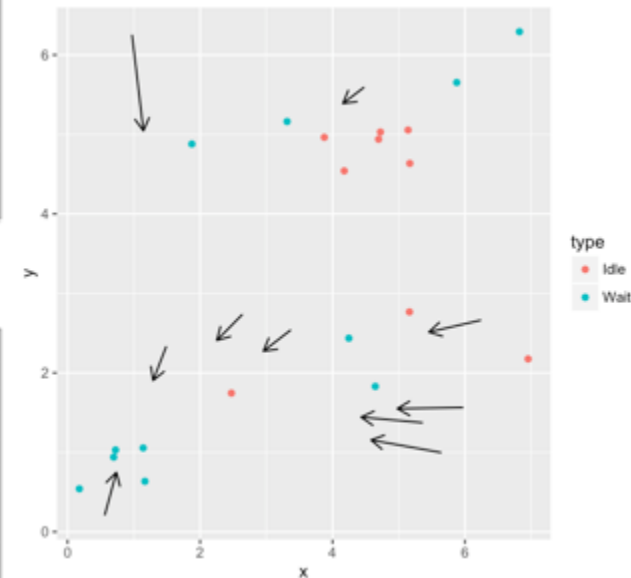


# Surge Pricing and Redistribution

- Ride hailing operator can iteratively adjust price in each TAZ to maximize revenues or minimize wait time
- Surge price will be used primarily in choice model of ride hailing agents to enter the market
- Ride hail taxis are redistributed according to iterative learning algorithm that minimizes customer wait times



Redistribution Gradient



# Scenario and Analyses

## Scenarios

- San Francisco Only Scenario
  - 3% Sample (25k person, 26k vehicles, 500 TNC fleet, Muni + BART)
- Full Bay Area Scenario
  - 5% Sample (~400k persons, 340k cars)
  - Full Transit (27 agencies, 828 routes)
  - TNC Fleet (20,000 - also referred to as Ride Hailing)

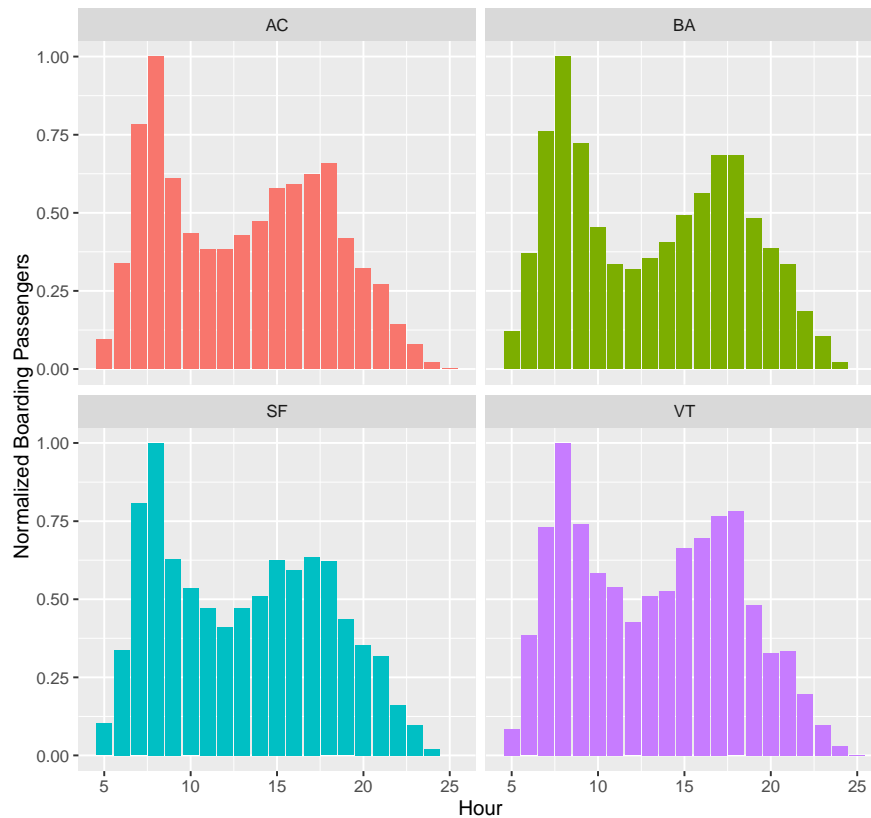
## Analyses:

- Validation – Full SF Bay
- Transit Price – SF Only
- Transit Capacity – SF Only
- TNC Price – SF Only
- TNC Number – SF Only
- Losing Transit Service – Full SF Bay
- Surge Pricing – SF Only

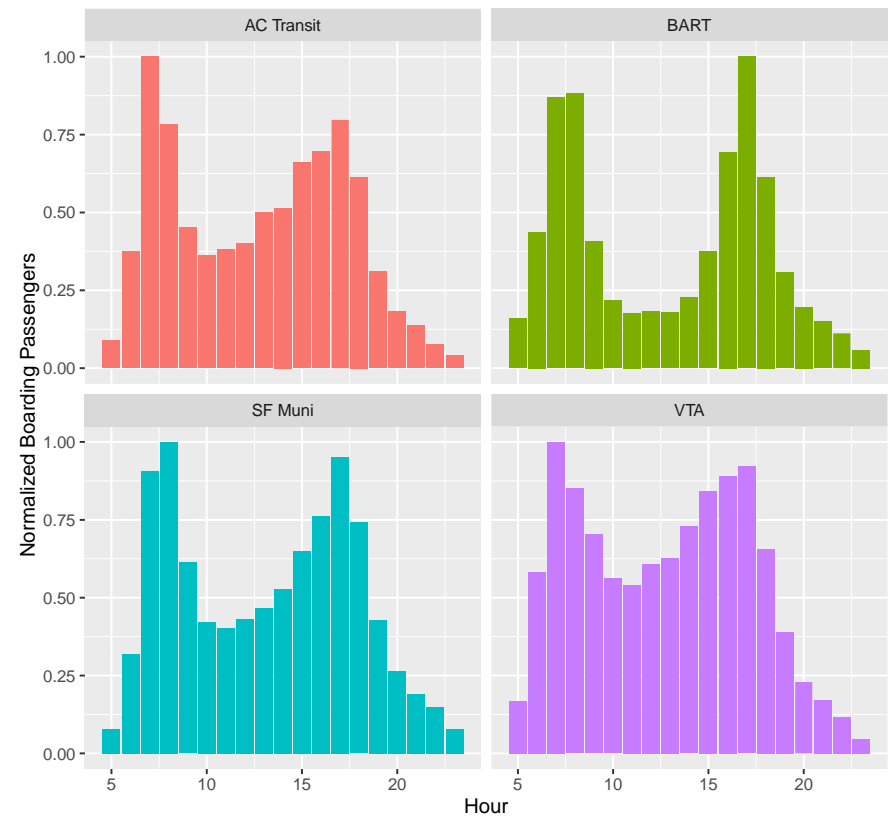


# Preliminary Validation

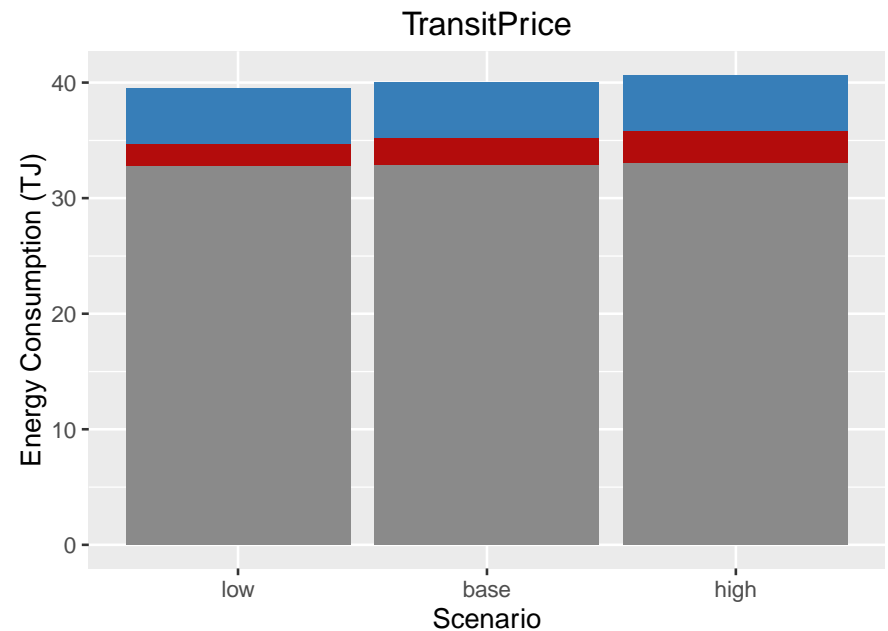
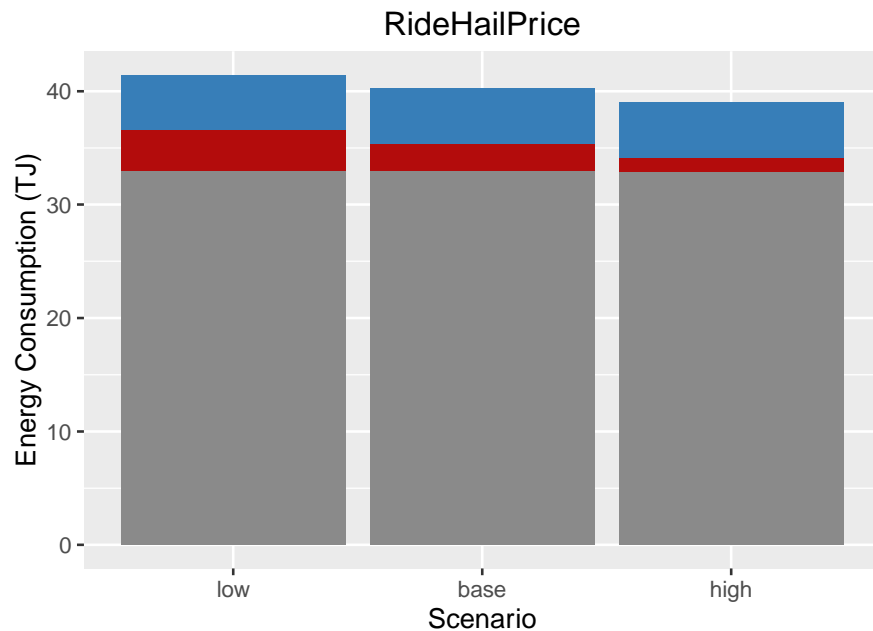
Modeled: BEAM



Observed: Clipper



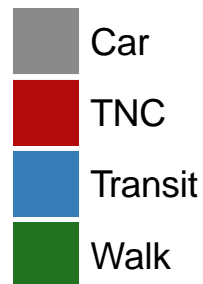
# Price Sensitivities



## Scenarios:

- Low -25%
- Base
- High +25%

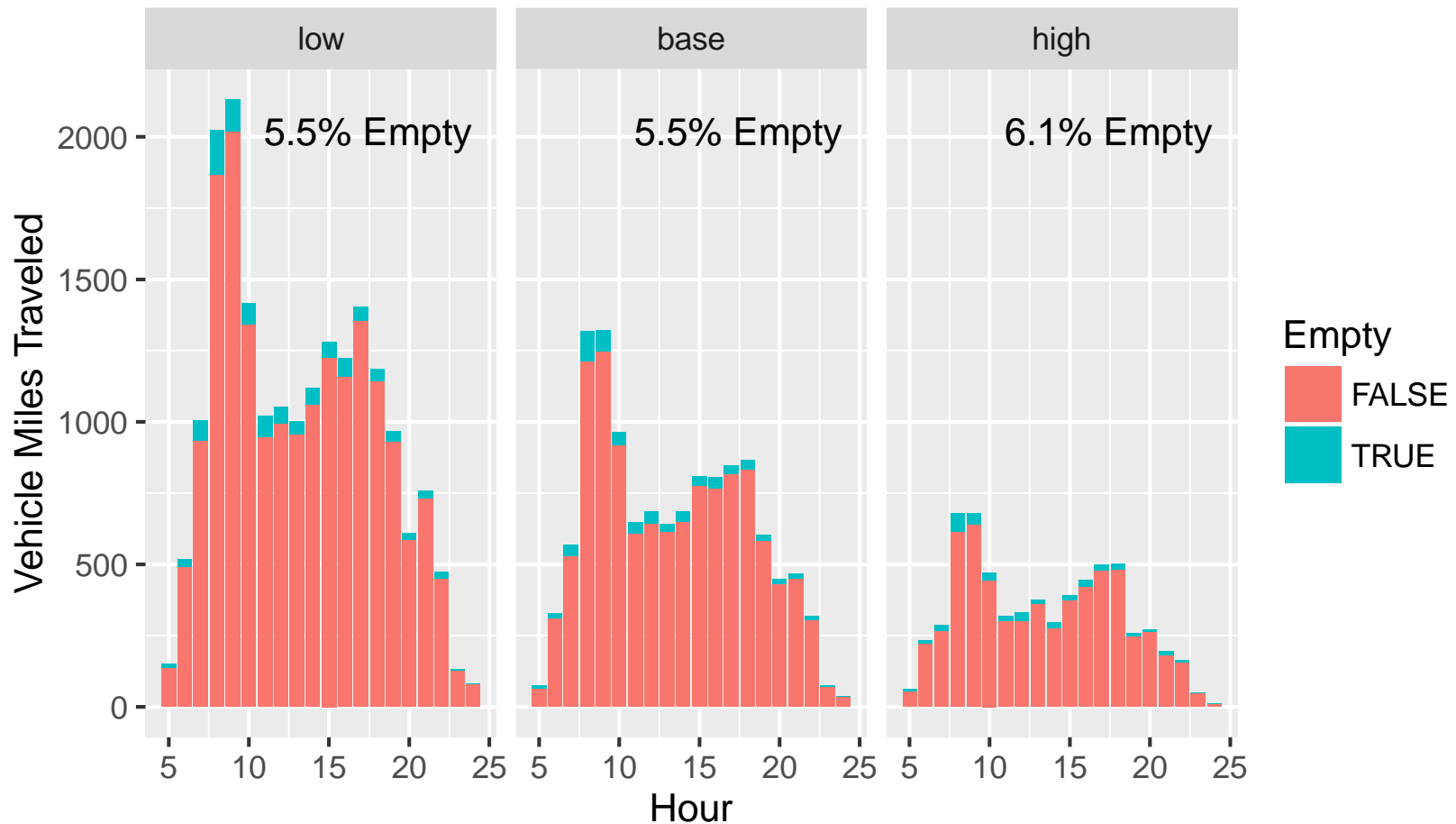
## Trip Mode



## Scenarios:

- Low -50%
- Base
- High +50%

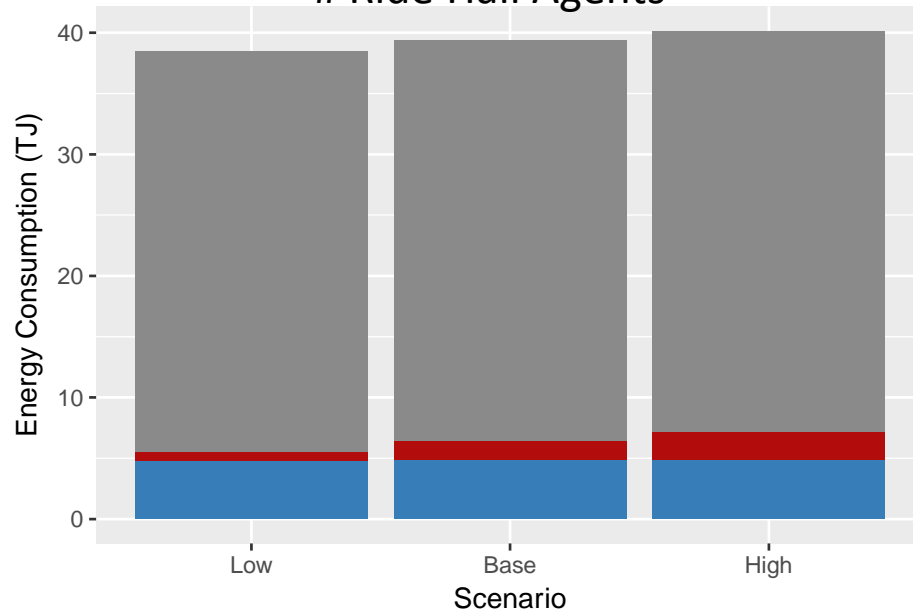
# Deadheading vs Price of TNCs



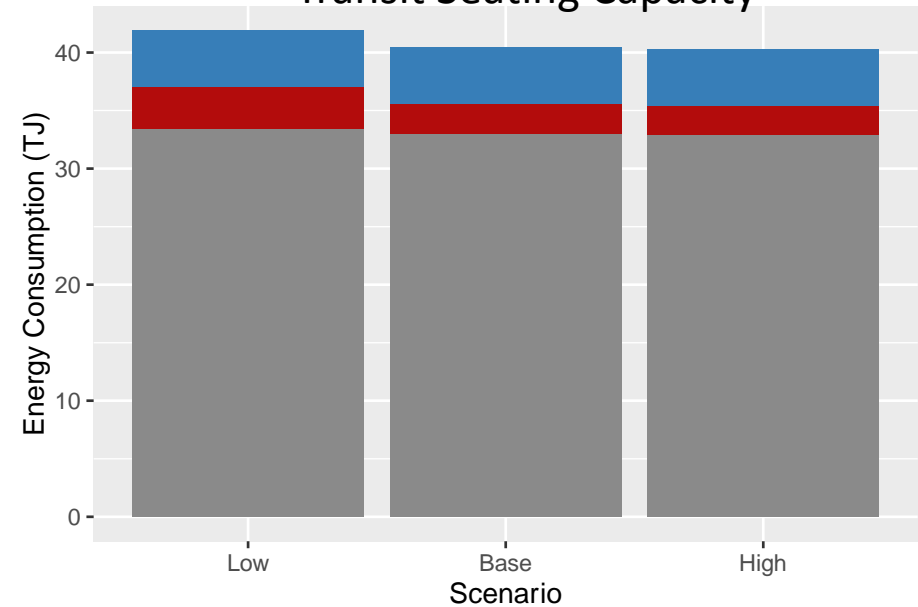


# TNC and Transit Capacities

# Ride Hail Agents



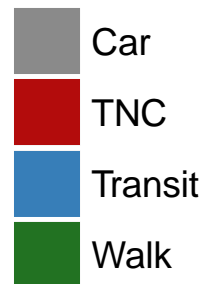
Transit Seating Capacity



## Scenarios:

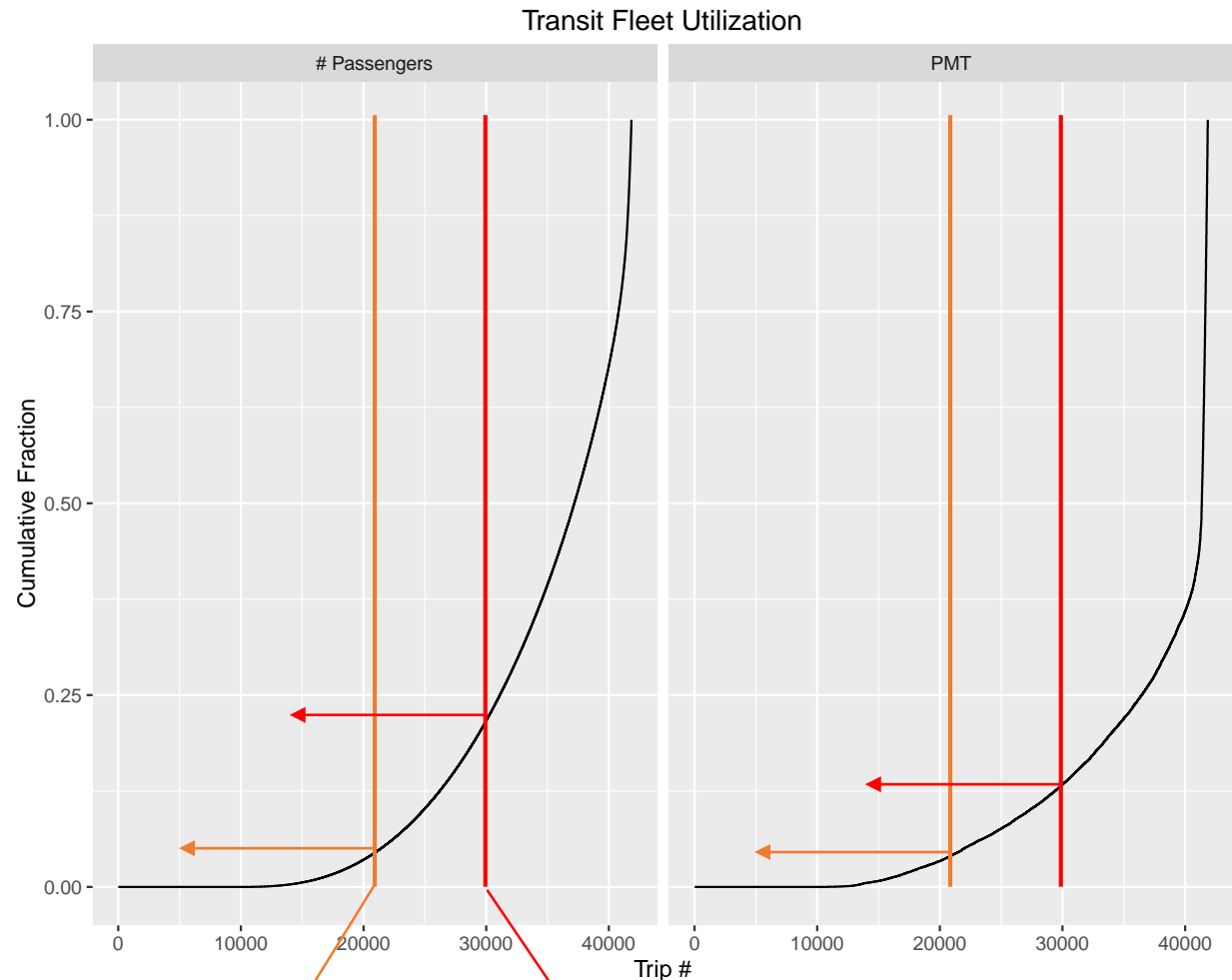
- Low -66%
- Base
- High +66%

## Trip Mode



# Impact of Losing Transit Service

- What if low ridership transit lines are supplanted by low cost TNCs?
- To investigate, we analyze transit ridership in a base scenario, and delete low-ridership trips from the GTFS schedules

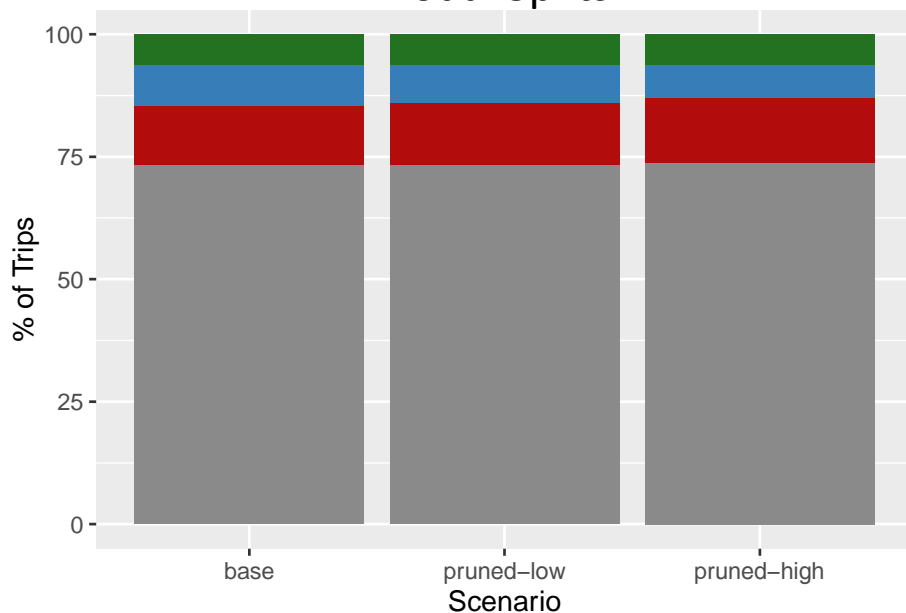


Pruned-Low

Pruned-High

# Impact of Losing Transit Service

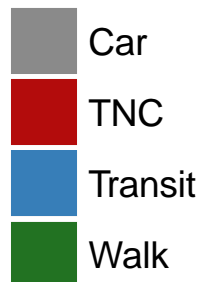
## Modal Splits



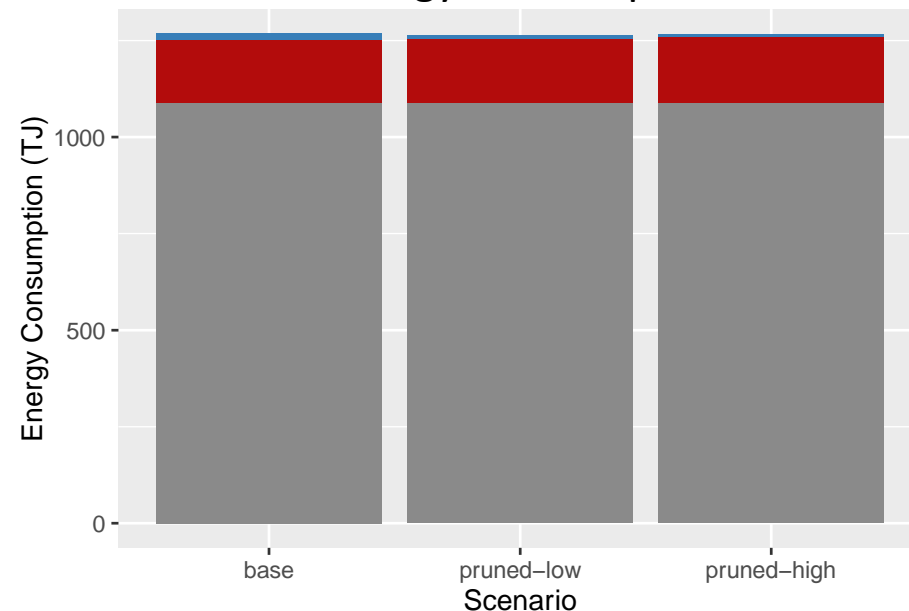
## Scenarios:

- Base
- Pruned-Low ~50% trips
- Pruned-High ~75% trips

## Trip Mode

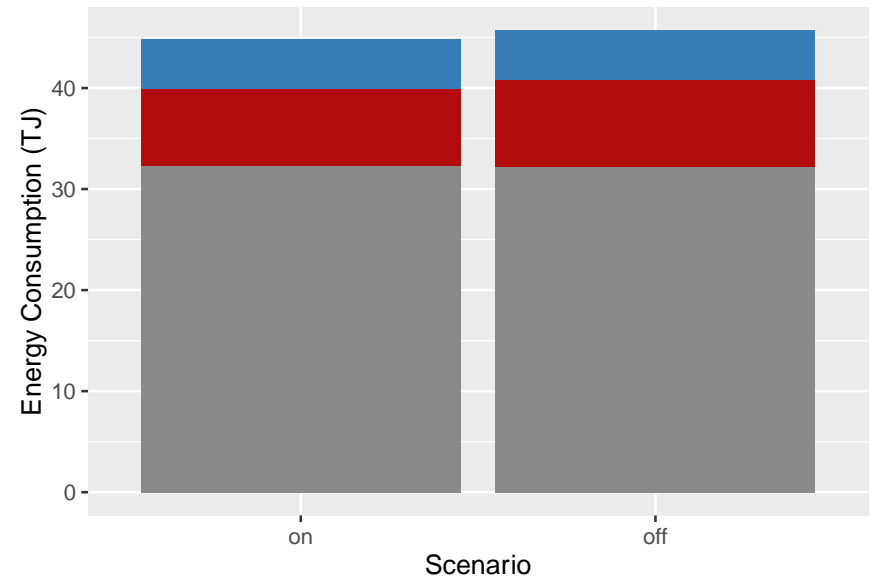
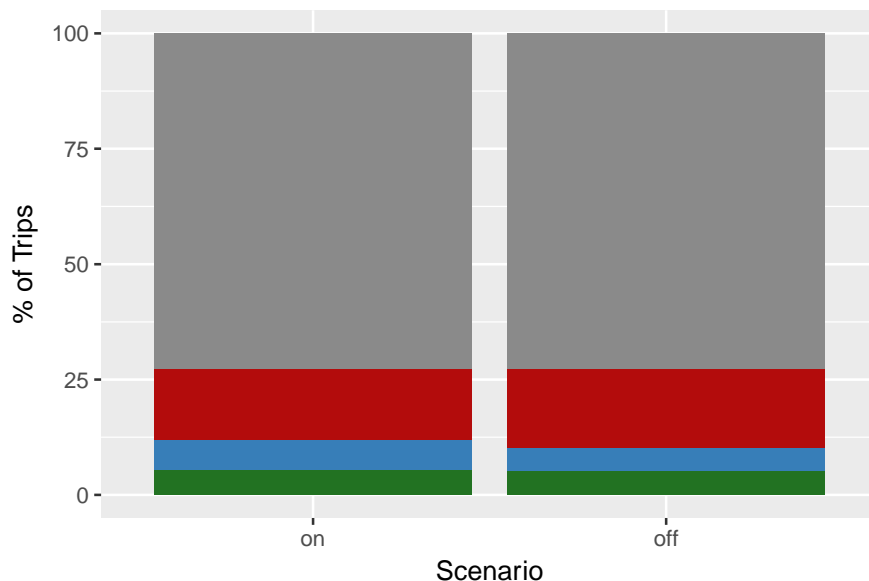


## Energy Consumption



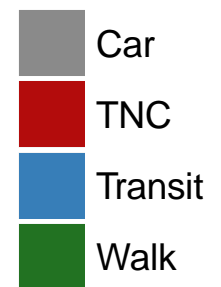
- Energy consumption largely unchanged as low / no-passenger transit vehicles are replaced by light duty vehicles
- Marginal impacts on modal split
- TNC predominant replacement to missing transit services

# Impact of Surge Pricing



- Using multinomial logit choice model
- Surge pricing reduces TNC share by 2 percentage points
- Of those no longer using TNC: 80% shift to Transit, 15% to walking, 5% to car
- Surge pricing decrease energy consumption by 2%

## Trip Mode



# Response to FY17 Reviewers

**This Project was not reviewed in FY17**

# Collaborations



- Authors of open source R5 multimodal routing software
- Assisting with integration of router into BEAM
- Assisting with transit data feed editing tools



- Developing ride hailing fleet optimization schemes for customer matching, rebalancing, and EV charging to deploy within BEAM



# Remaining Challenges

- Navigate balance between larger scale runs versus smaller scale but more runs capable of exploring more sensitivities and scenarios
- Ride hailing lack of data
  - Using best available currently, exploring better options
- Developing robust scenarios for analyzing changes to transit system

# Remaining Work

## FY18 Remaining Work

- Complete model enhancements:
  - Allow TNC for first/last mile service to public transit
  - Enable TNC fleets to rebalance according to customer wait time minimization heuristic
- Develop scenarios to simulate transit improvements / degradations:
  - increased light rail capacity
  - bus rapid transit
  - parking accessibility
  - curtailments in transit service
- Conduct analysis of impacts with above enhancements in place

## FY19 Future Work

- Study impact of long-term system changes on energy use, e.g.:
  - Major changes to transit system (new stations, routes, schedule increases)
- Study connection between transportation mega-trends and land use

# Summary

- It is difficult to observe from transit ridership data the extent to which TNCs are acting as direct substitutes versus facilitating access to transit.
- This task will directly assess the ridership and energy impacts of a system with and without various TNC/transit configurations.



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# QUESTIONS?

# Technical Back-Up Slides